# 8<sup>ÈME</sup> JOURNÉE RÉGIONALE DES DOCTORANTS EN AUTOMATIQUE

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**Unmixing performance Demosaicing performance** 201 ItSD + Unmixing → Naive WNMF PSNR [dB] 20 SNR [dB]

Performing unmixing after demosaicing SSI images is not a good strategy. Instead, unmixing from the SSI data is far better!

## A Dedicated Joint Unmixing and Demosaicing Method for Snapshot Spectral Images

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#### **Snapshot Spectral Imaging (SSI)**

 Strategies for miniaturized HSI sensors (on the left for images, middle and right for videos - Source IMEC).







- ► Demosaicing = providing a datacube combining full spectral information & good spatial resolution
- ► Various approaches have been proposed:
  - ► Weighted bilinear interpolation (WB)
- ► Iterative Spectral Difference (ItSD) ► Multispectral demosaicing approach using a pseudo-panchromatic image
- ► Binary Tree-Based Generic Demosaicing (BTES)
- Graph and rank regularized method (GRMR)

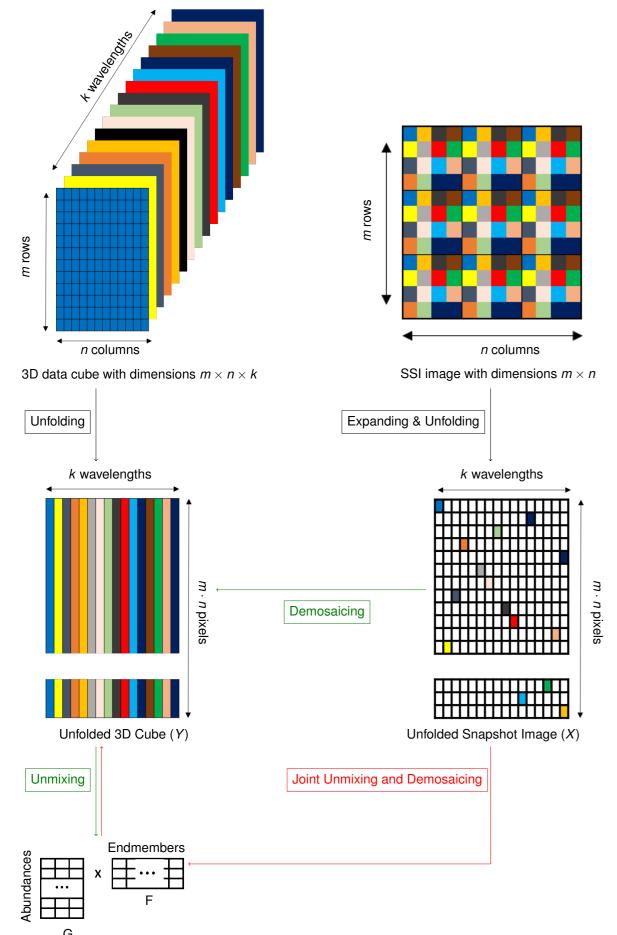


Figure: Principles of the two-step (in green) and joint (in red) strategies.

#### **Performing classification after demosaicing provides a poor** classification performance [1]

- ▶ In [2], joint low-rank matrix completion and factorization far more accurate than a two-stage approach.
- Joint Demosaicing and Unmixing more efficient than a two-stage approach?

#### **Naive Method**

► Weighted Non-negative Matrix Factorization (WNMF) is used to solve the joint demosaicing and unmixing problem.

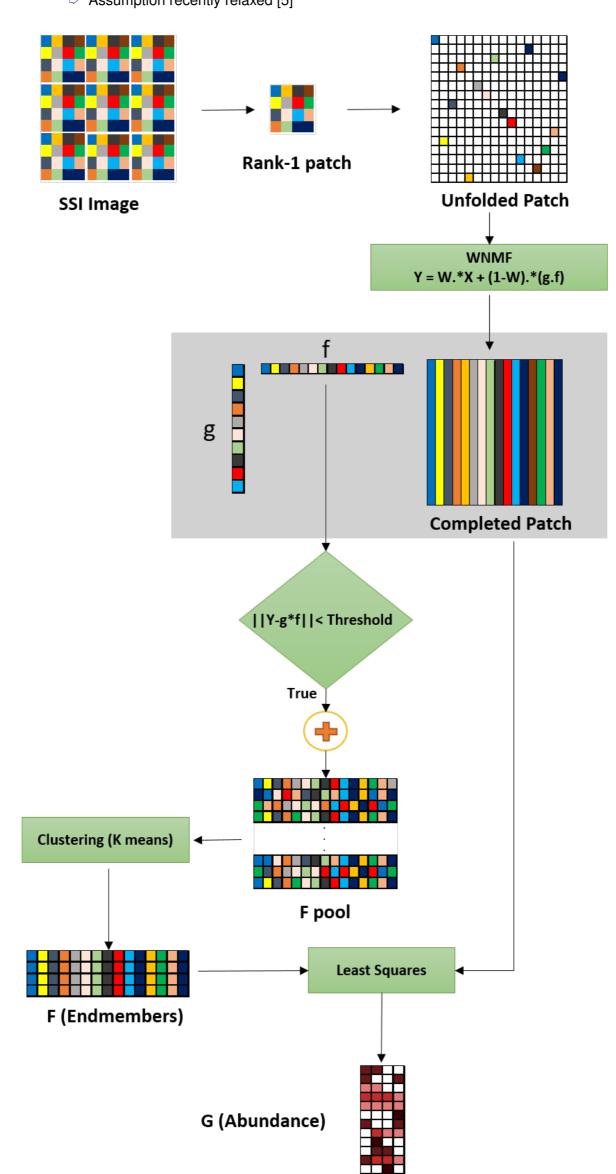
$$\hat{Y} = W \circ X + (\mathbb{1}_{(m \cdot n) \times k} - W) \circ (G \cdot F), \tag{1}$$

SNR [dB]

- ▶ W denotes a binary weight matrix whose nonzero entries allow to select which wavelength is observed by the camera in the case of ideal filter.
- ▶ W denotes the contributions of each wavelength in the observed wavelength in the case of the real filter.
- ► Can be solved using Expectation Maximization WNMF framework

### **Proposed Low-rank Completion-Based Method**

- ▶ Patch-based rank-1 completion WNMF method (KPWNMF) [4]
- Assumes some local abundance sparsity
- ► Finds locally rank-1 patches which correspond to almost "pure patches" Assumption recently relaxed [5]



#### **Real Filter Harmonics Problem**

- ► Fabry-Perot filters introduce additional harmonics around each wavelength of interest in real implementation.
- ► These filters are known and are provided by the camera manufacturers.
- Our proposed method takes these harmonics into consideration.

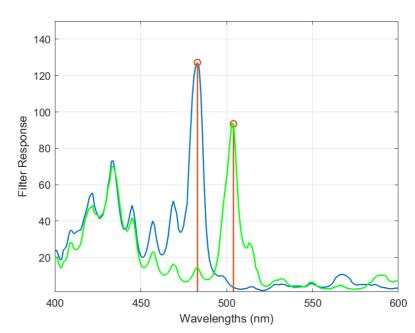


Figure: Ideal (in red) and real (in blue and green) spectral response of two Fabry-Perot filters of the  $4 \times 4$  IMEC SSI camera.

## **Experiment and Results**

- ► To validate the performance of the proposed approach, we conduct an experiment on Jasper Ridge image.
- ▶ We assume that the hyperspectral imagery is acquired using a SSI camera system, equipped with  $5 \times 5$  and  $4 \times 4$  spectral filter patterns.
- Simulations assuming an ideal and real snapshot mosaic filters.
- ► Reconstruction quality is measured in terms of Peak Signal-to-Noise Ratio (PSNR, in dB) while the unmixing enhancement is measured using Signal-to-Interference Ratio (SIR, in dB).
- ► Far better unmixing performance reached by our proposed approach than with 2-stage techniques and naive WNMF
- ► Still demosaicing similar or slightly better than SotA methods

## **Conclusion and Future Work**

- ► The proposed method provides a slightly better demosaicing performance than state-of-the-art methods and a much higher unmixing enhancement.
- ▶ We aim to investigate the use of our proposed methods on real SSI data.
- We also aim to extend them to the case when endmember spectral variability is met in the acquisition process.

## **Acknowledgements and References**

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- G. Tsagkatakis, M. Bloemen, B. Geelen, M. Jayapala, and P. Tsakalides. "Graph and Rank Regularized Matrix Recovery for Snapshot Spectral Image Demosaicing". In: IEEE Trans. Comput. Imaging 5.2 (June 2019), pp. 301-
- C. Dorffer, M. Puigt, G. Delmaire, and G. Roussel. "Informed nonnegative matrix factorization methods for mobile sensor network calibration". In: IEEE Trans. Signal Inf. Process. Netw. 4.4 (2018), pp. 667-682
- C. Dorffer, M. Puigt, G. Delmaire, and G. Roussel. "Fast Nonnegative Matrix Factorization and Completion Using Nesterov Iterations". In: Proc. LVA/ICA'17. Vol. 10169. LNCS. Feb. 2017, pp. 26-35.
- K. Abbas, M. Puigt, G. Delmaire, and G. Roussel. Méthode de démélange et dématriçage conjoints fondée sur la complétion de rang un pour les images multispectrales «snapshot». to appear in GRESTI'22.
- K. Abbas, M. Puigt, G. Delmaire, and G. Roussel. Filtering-Based Endmember Identification Method for Snapshot Spectral Images. to appear in Proc. WHISPERS'22.









